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Implementing a sectional scheme for early aerosol growth from new particle formation in the Norwegian Earth System Model v2: comparison to observations and climate impacts

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Abstract. Aerosol–cloud interactions contribute to a large portion of the spread in estimates of climate forcing, climate sensitivity and future projections. An important part of this uncertainty is how much new particle formation (NPF) contributes to cloud condensation nuclei (CCN) and, furthermore, how this changes with changes in anthropogenic emissions. Incorporating NPF and early growth in Earth system models (ESMs) is, however, challenging due to uncertain parameters (e.g. participating vapours), structural issues (numerical description of growth from ~ 1 to ~ 100 nm) and the large scale of an ESM grid compared to the NPF scale. A common approach in ESMs is to represent the particle size distribution by a certain number of log-normal modes. Sectional schemes, on the other hand, in which the size distribution is represented by bins, are considered closer to first principles because they do not make an a priori assumption about the size distribution.

In order to improve the representation of early growth, we have implemented a sectional scheme for the smallest particles (5–39.6 nm diameter) in the Norwegian Earth System Model (NorESM), feeding particles into the original aerosol scheme. This is, to our knowledge, the first time such an approach has been tried. We find that including the sectional scheme for early growth improves the aerosol number concentration in the model when comparing against observations, particularly in the 50–100 nm diameter range. Furthermore, we find that the model with the sectional scheme pro-

duces much fewer particles than the original scheme in polluted regions, while it produces more in remote regions and the free troposphere, indicating a potential impact on the estimated aerosol forcing. Finally, we analyse the effect on cloud–aerosol interactions and find that the effect of changes in NPF efficiency on clouds is highly heterogeneous in space. While in remote regions, more efficient NPF leads to higher cloud droplet number concentration (CDNC), in polluted regions the opposite is in fact the case.

1 Introduction

The formation of new particles in the atmosphere, known as new particle formation (NPF), occurs through the clustering and nucleation of low-volatility vapours. These particles can then influence the climate by growing via condensation to sizes at which they act as cloud condensation nuclei (CCN) (Twomey, 1974; Albrecht, 1989) – or even by interacting directly with radiation if they grow large enough (Boucher et al., 2013). NPF has received increasing attention in recent years due to the aforementioned climate impacts as well as its implications for human health. This has led to new insights into the mechanisms involved in NPF, and subsequently new parameterization schemes have been developed and included in Earth system models (ESMs). For example, Gordon et al. (2016) showed that including a NPF pathways

from pure organic nucleation nucleation (Kirkby et al., 2016; Riccobono et al., 2014; Gordon et al., 2017, 2016; Dunne et al., 2016; Tröstl et al., 2016) in a global aerosol model resulted in a considerable diminishing of the estimated negative forcing due to aerosol–cloud interactions since pre-industrial times ($+0.22 \text{ W m}^{-2}$, 27 %). This result illustrates the importance of adequately representing the effects of NPF in ESMs for our understanding of historical forcing and thus climate sensitivity, especially considering that cloud–aerosol interactions are estimated to be responsible for a large fraction of the observed negative radiative forcing since pre-industrial times (Boucher et al., 2013).

In spite of NPF being the subject of a lot of research over recent years, there is still uncertainty about the species involved in both nucleation and subsequent particle growth (Kerminen et al., 2018; Lee et al., 2019). In order for NPF to be successful, particles must form and grow up to a decent size, often defined to be out of the nucleation mode, i.e. 10 nm. Due to the Kelvin effect, only atmospheric gases with very low volatility are able to contribute to the initial steps in NPF, and in many atmospheric conditions the growth rates provided are too slow for particles to survive losses to coagulation and evaporation (Semeniuk and Dastoor, 2018). Sulphuric acid is known to be the most important species for nucleation due to its low vapour pressure, while bases such as amines and ammonia may enhance the nucleation rate (Lee et al., 2019; Kerminen et al., 2018). There is evidence that extremely low-volatility organic vapours also contribute significantly, especially in remote areas (Semeniuk and Dastoor, 2018; Dunne et al., 2016; Riccobono et al., 2014). For the subsequent growth of the particles, the Kelvin effect decreases and condensing organics of higher volatility, predominantly originating from the oxidation of biogenic volatile organic compounds (BVOCs), become more and more dominant and are essential in most environments (Riipinen et al., 2011; Tröstl et al., 2016).

During all stages of particle growth, the particles are subject to coagulation, reducing the number of particles that form and that grow to sizes at which they can act as CCN ($\sim 50 \text{ nm}$ in diameter; Kerminen et al., 2012). The majority of this coagulation will occur with particles that are already in the CCN size range and thus results in a net loss of particles that could eventually act as CCN. However, when two small particles (below the CCN size range) coagulate, this contributes to growth of the combined particle, which could then become a cloud condensation nucleus (e.g. Kerminen et al., 2018; Lee et al., 2013; Schutgens and Stier, 2014). This effect, though, is only significant in highly polluted regions. The survival rate of NPF particles to CCN sizes is therefore in general dependent on competition between the particle growth rate by condensation and the coagulation sink.

The formation of new particles is tightly constrained by negative feedbacks. If NPF is high, the result will be an increase in particle number and with it an increase in the available surface area for condensation. This will lead to an in-

crease in both condensation and coagulation sink, which further decreases the growth rate and increases the coagulation sink of new particles forming. The result is then a suppression of further NPF (e.g. Westervelt et al., 2014, 2013; Semeniuk and Dastoor, 2018; Carslaw et al., 2013; Kerminen et al., 2018; Schutgens and Stier, 2014). These loss processes which constrain the survival of new particles to larger sizes may in fact often be more important than the nucleation rate in itself. For example, Carslaw et al. (2013) show that the Global Model of Aerosol Processes (GLOMAP) has low sensitivity for particles larger than 50 nm to nucleation rate parameterizations but high sensitivity to processes affecting the coagulation loss of newly formed particles. This underlines the importance of adequately representing the processes that constrain the formation of new particles. If not we could end up with models wherein both the aerosol number concentration and CCN are overly sensitive to changes in emissions.

While there is a large body of work on describing when NPF happens in many individual environments, the transferal of this to a generalized context (which is what is needed for a climate model) is very uncertain. In other words, based on knowledge of what drives NPF in a specific environment it is not easy to derive a general parameterization (Kerminen et al., 2018; Lee et al., 2019).

From the perspective of an ESM, aerosols only become relevant when they approach $\sim 50 \text{ nm}$ in diameter and may, depending on the conditions, act as CCN (Kerminen et al., 2012). However, because the formation of particles in this size range is highly dependent on aerosol dynamics at smaller sizes, climate models need to treat these dynamics with a sufficient degree of accuracy. Since climate models are required to run hundreds of years of simulations within a reasonable time span, this involves a trade-off between representing the physical process to the best of our scientific understanding on one hand and computational cost on the other hand.

In ESMs, it is common to use modal schemes to represent the particle size distribution – i.e. describing the distribution as the sum of some number of log-normal modes (e.g. Stier et al., 2005; Liu et al., 2005; Mann et al., 2010; Vignati et al., 2004). On the other hand, sectional schemes – in which the size distribution is represented by bins (e.g. Spracklen et al., 2005; Kokkola et al., 2008) – are in general considered closer to first principles because they do not make an a priori assumption about the size distribution. Nevertheless, modal schemes are generally favoured in ESMs because they require fewer tracers and are much cheaper computationally.

Any size-resolving aerosol scheme must have a cut-off diameter at which explicit modelling of aerosol number, growth and losses begins. One natural choice is the size of the critical cluster, around 1 nm (Lee et al., 2013). While this means that the entire size distribution of particles is treated, it adds disproportionate computational cost to the simulation for aerosols with a very short atmospheric lifetime (due to both growth out of the size range and high sensitivity to co-

agulation) (see e.g. Lee et al., 2013). An alternative is to parameterize the growth and coagulation loss of particles up to a larger diameter, which is the approach used in most ESMs (Kerminen and Kulmala, 2002; Kerminen et al., 2004; Lehtinen et al., 2007; Anttila et al., 2010). These methods involve estimating the flux or the formation of particles at the cut-off diameter, be it modal or sectional, based on estimated growth rate and coagulation sink (see details in the model description).

There are several drawbacks of this approach, especially if the chosen cut-off diameter is high. The most important one is that it assumes steady state, i.e. the same constant growth rates from the particle formed up to the cut-off value, which in reality could take several time steps and long enough for conditions to change substantially (hours). A particle may form under conditions with a high growth rate, but in the time it would take for the particle to grow to the cut-off diameter, the growth rate might decrease due to an increased condensation sink by the many new particles being formed. In a model with a relatively high cut-off, this would lead to an overestimation of the growth rate of the nucleated particle, which would in turn lead to an overestimation of the formation rate at the cut-off (Olenius and Riipinen, 2017; Lee et al., 2013). Olenius and Riipinen (2017) test the effect of the cut-off diameter by explicitly modelling the formation of particles from vapour molecules to 10 nm diameter and find an overprediction by a factor of 2 or even orders of magnitude. Similarly, Lee et al. (2013) suggest that during nucleation events, the smallest particles (< 10 nm) can be a significant condensation sink, thus regulating nucleation via reduced concentrations of precursors. They investigate the effects of cut-off diameter with a sectional aerosol scheme in the GISS-TOMAS model and compare a 1 nm cut-off with 3 and 10 nm cut-offs using Kerminen et al. (2004) to parameterize the survival of nucleated particles to the cut-off. They find that using a 10 nm cut-off leads to an overestimation of CCN at 0.2 % supersaturation, with 10 %–20 % overestimation in the surface layer in most of the Northern Hemisphere, while the globally averaged change to CCN(0.2 %) is minor. Furthermore, a 10 nm cut-off produces a high bias in the concentration of particles larger than 10 nm (N_{10}) of up to a factor of 3–5 in regions with high nucleation. In addition, they find that the 10 nm cut-off is sensitive to the time step.

Another drawback of a high cut-off diameter is that most of these parameterizations neglect self-coagulation within the sub-cut-off size range, which can be an important growth mechanism during intense new particle formation events. This concern is, however, taken into account in the Anttila et al. (2010) parameterization.

Finally, if the cut-off diameter is high, the time and location at which the new particles are inserted into the aerosol model may be effected since the parameterized growth would add the particles, at the cut-off size, in the same time step as they would be formed, i.e. within ~ 0.5 h. In reality, this growth could take several hours to days depending on loca-

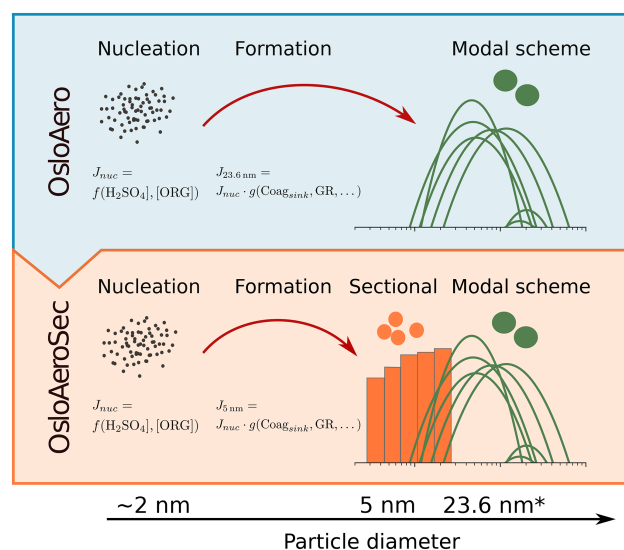


Figure 1. Illustration of changes from OsloAero to OsloAeroSec. In both versions, the nucleation rate is calculated at around 2 nm, followed by a calculation of the formation rate (the particles surviving) at 5 and 23.6 nm in OsloAeroSec and OsloAero, respectively, with Lehtinen et al. (2007). In OsloAero, these particles are inserted directly into the modal scheme, while in OsloAeroSec, the particles are inserted into the sectional scheme wherein they can be affected by growth and coagulation over time and space. Finally, the particles in the sectional scheme are moved from the last bin of the sectional scheme to the modal scheme. * 23.6 nm is the number median diameter of the mode the particles from the sectional scheme are moved to, but particles are actually grown to the volume median diameter (39.6 nm) before they are moved to the modal scheme in order to conserve mass.

tion, at which point the air mass may have moved considerably. This is in particular the case with a high cut-off value, like in NorESM (23.6 nm) (Kirkevåg et al., 2018).

In order to improve the representation of early particle growth, we have implemented a sectional scheme for the smallest particles (5–39.6 nm diameter) in the aerosol scheme in the Norwegian Earth System Model (NorESM). The sectional scheme acts as an intermediate step during NPF and feeds the grown particles into the original modal scheme. This is, to our knowledge, the first time such a hybrid approach has been attempted. The sectional scheme currently involves two condensing species (sulfuric acid and low-volatility organics) and five bins. The aerosol scheme with these changes will be referred to as OsloAeroSec. A schematic of the changes from OsloAero (the original model) to OsloAeroSec is shown in Fig. 1. The motivation is as follows.

1. In the original modal scheme in NorESM, the smallest mode has an initial number median diameter of 23.6 nm (volume median diameter of 39.6 nm). Particles from new particle formation are inserted into this mode using the parameterization from Lehtinen et al. (2007). It

thus does not take into account dynamics within the sub-23.6 nm range (e.g. competition for condensing vapours and growth of particles over more than one time step).

2. Including a sectional scheme for this size range brings the modelling of early growth closer to first principles while keeping an acceptable computational cost because the number of species involved is low. A sectional scheme within this range represents a good alternative to a nucleation mode, which is known to have problems with transferring particles to the larger mode due to the addition of new particles reducing the median diameter of the mode.

In the following we start by describing the aerosol scheme in NorESM (Sect. 2.1) and then the newly implemented sectional scheme for early growth (Sect. 2.2). Next, in Sect. 4.1, we show that the new scheme leads to improvements in the CCN-relevant particle number concentration and size distribution when compared to observational data from Asmi et al. (2011a) consisting of 24 stations in Europe and compiled as part of the EUSAAR project. Finally, we present the global changes in the state of aerosols and following cloud properties in the model with the new scheme (OsloAeroSec) compared to the original model (Sect. 4.2).

2 Model description

We start by briefly describing the Norwegian Earth System Model (NorESM) in general before giving a detailed description of its default aerosol model, OsloAero, in Sect. 2.1. After this, in Sect. 2.2, we will describe what changes to said aerosol scheme have been introduced in OsloAeroSec. In general, the aerosol scheme after NPF and early growth is left as it is. The only exception to this is that we have also included some changes to the diurnal variability of OH, as described in Sect. 2.3.

The Norwegian Earth System Model version 2 (NorESM2) (Seland et al., 2020b; Bentsen et al., 2013; Kirkevåg et al., 2013; Iversen et al., 2013) is largely based on the Community Earth System Model (CESM) version 2 (Danabasoglu et al., 2020; Neale et al., 2012). The aerosol scheme in CESM2 is replaced by OsloAero6 (described below) (Kirkevåg et al., 2018), and the atmospheric component is thus named CAM6-Nor. Furthermore, the ocean model in CESM2 is replaced by the Bergen Layered Ocean Model (BLOM) (Seland et al., 2020b), though this is not used in this study as all simulations are run with prescribed sea surface temperature (SST) and sea ice concentrations. The land model is, as in CESM2, is the Community Land Model (CLM) version 5 (Lawrence et al., 2019).

2.1 OsloAero: aerosol scheme in NorESM

The aerosol scheme in NorESM, OsloAero, is a production-tagged aerosol model. The most notable difference to other

aerosol models is that the aerosol mass is divided into “background” tracers and “process” tracers. The background tracers form log-normal modes which decide the number concentration, while the process tracers alter this initial log-normal distribution and their chemical composition. Examples of background tracers are dust, sea salt and particles from NPF, while examples of process tracers are sulfate condensate, sulfate coagulate and organic condensate. After the process tracers are applied, the resulting distribution of the “mixtures” is not (necessarily) log-normal anymore. The mass of the tracers is tracked, and the size distributions for cloud activation and optical properties are calculated using a look-up table approach (Kirkevåg et al., 2018).

2.1.1 Chemistry

CAM6-Nor has a simplified chemistry scheme for sulfur and organic species using the chemical pre-processor MOZART (Emmons et al., 2010). Pre-calculated monthly mean oxidant fields consisting of OH, O₃, NO₃ and HO₂ are read from a file (for discussion see Karset et al., 2018).

Condensing tracers in the model are H₂SO₄ and two tracers of organics produced by the oxidation of BVOCs, low-volatility organics (SOAG_{LV}) and semi-volatile organics (SOAG_{SV}). The model treats both organic tracers as non-volatile during condensation but represents the volatility by separating which processes each tracer can contribute to: SOAG_{LV} can contribute to new particle formation (NPF) and early growth, while SOAG_{SV} only contributes to condensational growth.

H₂SO₄ is emitted directly or produced from oxidation of SO₂ by OH or aqueous-phase oxidation by H₂O₂ and O₃ (Tie et al., 2001). SO₂ is either emitted directly or produced by oxidation of dimethyl sulfate (DMS). The condensing organic tracers, SOAG_{LV} and SOAG_{SV}, are formed from oxidation isoprene and monoterpenes. The emissions of isoprene and monoterpene are calculated online in each time step using the Model of Emissions of Gases and Aerosols from Nature version 2.1 (MEGAN2.1) (Guenther et al., 2012), which is incorporated into CLM5. The atmospheric tracer includes only one tracer for monoterpenes, and thus the emissions of 21 monoterpene species from MEGAN2.1 are lumped together (Kirkevåg et al., 2018). In addition, production of methanesulfonic acid (MSA) by oxidation of DMS is taken into account, but since the model lacks a tracer for MSA, 20 % of the MSA is put in the SOAG_{LV} tracer and 80 % in the SOAG_{SV}.

For a complete overview of reactions and reaction rates, see Table 2 in Karset et al. (2018).

2.1.2 Condensation

The following is a description of the condensation routine in chronological order within one time step. The production rate, P_{gas} , of a condensing gas is calculated in the gas-phase

chemistry (Sect. 2.1.1), and the condensation sink, L_{cond} [s^{-1}], is calculated based on the surface area of the background aerosols. Finally, using the initial concentration of the gas, C_{old} , from the previous time step, an intermediate concentration, C_{int} , is derived by solving the discrete Euler backwards equation:

$$\frac{C_{\text{int}} - C_{\text{old}}}{\Delta t} = P_{\text{gas}} - L_{\text{cond}} C_{\text{int}}, \quad (1)$$

$$C_{\text{int}} = \frac{C_{\text{old}} + P_{\text{gas}} \Delta t}{1 + L_{\text{cond}} \Delta t}. \quad (2)$$

This intermediate concentration is then used in the formation of new particles (described in the next section). The NPF subroutine returns an intermediate nucleated mass loss rate, $J_{m,\text{nuc}}$. This nucleated mass is then used to calculate a nucleation loss rate, L_{nuc} [s^{-1}].

$$L_{\text{nuc}} = \frac{J_{m,\text{nuc}}}{C_{\text{int}}} \quad (3)$$

The new gas concentration, C_{new} , is calculated by solving the discrete Euler backwards equation again, including the loss rate to nucleation.

$$C_{\text{new}} = \frac{C_{\text{old}} + P_{\text{gas}} \Delta t}{1 + L_{\text{cond}} \Delta t + L_{\text{nuc}} \Delta t} \quad (4)$$

Finally, the total gas lost to condensation and nucleation, ΔC , is calculated as follows.

$$C_{\text{new}} - C_{\text{old}} = P_{\text{gas}} \Delta t - \Delta C \quad (5)$$

$$\Delta C = P_{\text{gas}} \Delta t + C_{\text{old}} - C_{\text{new}} \quad (6)$$

This condensate and/or nucleate, ΔC , is then transferred to the corresponding process tracer for condensate of the species (e.g. sulfur condensate) and the background tracer for new particle formation particles. The mass transfer is done based on their relative contribution to the total loss rate – i.e. the fraction that is moved to the NPF tracer is $f_{\text{nuc}} = L_{\text{nuc}} / (L_{\text{nuc}} + L_{\text{cond}})$ and the fraction to condensation is $f_{\text{cond}} = 1 - f_{\text{nuc}}$.

2.1.3 New particle formation

The tracers contributing to NPF are H_2SO_4 and organics (see Makkonen et al., 2014). As mentioned above, SOAG_{SV} does not contribute to new particle formation. In addition, only half of the SOAG_{LV} concentration in each time step is assumed to be low-volatility enough to contribute, and this fraction will be denoted as ELVOC in the following. The nucleation rate is parameterized with Vehkamäki et al. (2002) for binary sulfuric acid–water nucleation in the entire atmosphere, and, in addition, Eq. (18) from Paasonen et al. (2010) is added to represent boundary layer nucleation. The Paasonen et al. (2010, Eq. 18) parameterization is as follows:

$$J_{\text{nuc}} = A_1 [\text{H}_2\text{SO}_4] + A_2 [\text{ELVOC}], \quad (7)$$

where J_{nuc} [s^{-1}] is the nucleation rate, $A_1 = 6.1 \times 10^{-7} \text{ s}^{-1}$ and $A_2 = 3.9 \times 10^{-8} \text{ s}^{-1}$. This is the default nucleation equation in OsloAero and is changed in OsloAeroSec – see Sect. 2.2.1.

The survival of particles from nucleation at $d_{\text{nuc}} \approx 2 \text{ nm}$, to the background mode holding the NPF particles with number median diameter 23.6 nm, is parameterized by Lehtinen et al. (2007). The formation rate, $J_{d_{\text{mode}}}$, of particles at the smallest mode is calculated by

$$J_{d_{\text{mode}}} = J_{\text{nuc}} \exp \left(-\gamma d_{\text{nuc}} \frac{\text{CoagS}(d_{\text{nuc}})}{\text{GR}} \right), \quad (8)$$

where d_{nuc} is the diameter of the nucleated particle, $\text{CoagS}(d_{\text{nuc}})$ is the coagulation sink of the particles [h^{-1}], GR is the growth rate [nm h^{-1}] of the particle (from H_2SO_4 and ELVOC, calculated using Eq. 21 from Kerminen and Kulmala, 2002), and γ is a function of d_{mode} and d_{nuc} :

$$\gamma = \frac{1}{m+1} \left[\left(\frac{d_{\text{mode}}}{d_{\text{nuc}}} \right)^{(m+1)} - 1 \right], \quad m = -1.6. \quad (9)$$

Furthermore, $\text{CoagS}(d_{\text{nuc}})$ is calculated from $\text{CoagS}(d_{\text{mode}})$ assuming a power-law dependency on diameter, $\text{CoagS}(d_{\text{nuc}}) = \text{CoagS}(d_{\text{mode}}) \cdot \left(\frac{d_{\text{nuc}}}{d_{\text{mode}}} \right)^m$ (Lehtinen et al., 2007, Eq. 5).

Since Kirkevåg et al. (2018), we have developed an improvement to the new particle formation rate (also used in Sporre et al., 2019, 2020). The $\text{CoagS}(d_{\text{nuc}})$ previously included only coagulation onto accumulation- and coarse-mode particles, but we amended this to include coagulation onto all pre-existing particles. This modification gives a lower and more realistic survival rate of particles from formation at 2 to 23.6 nm.

2.1.4 Coagulation

OsloAero takes into account coagulation between Aitken-mode and accumulation-mode particles and between Aitken-mode and coarse-mode particles, with coagulation coefficients from the Fuchs form for Brownian diffusion (Sect. 12.3 in Seinfeld and Pandis, 1998). Technically, a normalized coagulation sink is calculated for each relevant combination of background modes, assuming some fixed prior growth by condensation and/or coagulation. To compute the normalized coagulation sink, the size distribution is split into 44 bins for the coagulation receiver mode (the larger particle), and a coagulation sink with each bin is calculated and normalized by the number concentration. This way, the normalized coagulation sink only has to be computed once. In addition, coagulation of aerosols with cloud droplets is estimated. See Seland et al. (2008) for more details.

2.2 OsloAeroSec: new sectional scheme

The purpose of introducing the sectional scheme is to get a more realistic growth and loss dynamic within the small-

est aerosol sizes, with the aim of better modelling aerosol–climate effects. These smallest particles have insignificant effects on climate directly, but rather play a role through how they affect the size distribution of the larger particles. For this reason, we do not let the aerosols in the sectional scheme directly affect the radiation and cloud parameterizations, but rather consider only how new particle formation through nucleation, condensation and coagulation affects the larger aerosols in the modal scheme.

The sectional scheme currently consists of five bins (though this is flexible), and the bin sizes are set according to a discrete geometric distribution – the volume-ratio distribution (Jacobson, 2005, Sect. 13.3) – as follows: let d_1, d_2, \dots, d_5 be the diameter for each bin and v_1, v_2, \dots, v_5 be the volume per particle for each bin. Each particle in the bin is assumed to have this same volume (Jacobson, 2005). The volume-ratio distribution ensures that the volume per particle ratio between adjacent bins is fixed; i.e.

$$r_v = \frac{v_{i+1}}{v_i} \quad (10)$$

is fixed. This means that the ratio between the diameter in adjacent bins, r_d , will be

$$r_d = \frac{d_{i+1}}{d_i} = (r_v)^{1/3}. \quad (11)$$

Particles are moved into the original aerosol scheme in the NPF background mode when they reach $d_{\max} = 39.6$ nm, which is the volume median diameter of this mode. The volume median diameter is chosen to preserve both number and mass of the particles. Note that d_{\max} is the diameter at which the particles are moved to the modal scheme. The choice of d_{\min} , the smallest diameter bin, is flexible, and we have chosen 5 nm here. So for number of bins, N ,

$$r_d = \left(\frac{d_{\max}}{d_{\min}} \right)^{\frac{1}{N}}, \quad (12)$$

where $d_{\max} = 39.6$ nm, $d_{\min} = 5$ nm and $N = 5$.

The sectional scheme includes condensation from two precursors, H_2SO_4 and SOAG_{LV} , while SOAG_{SV} is considered to not have low enough volatility to contribute. This gives a total of N (number of bins) $\times 2$ tracers for the model to keep track of, keeping computational costs reasonable.

2.2.1 Nucleation

Nucleation is still parameterized with Vehkamäki et al. (2002) for binary sulfuric acid–water nucleation in the entire atmosphere, and the boundary layer nucleation has been updated from Paasonen et al. (2010, Eq. 18) (see Eq. 7) to Riccobono et al. (2014):

$$J_{\text{nuc}} = A_3 [\text{H}_2\text{SO}_4]^2 [\text{ELVOC}] \quad (13)$$

where $A_3 = 3.27 \times 10^{-21} \text{ cm}^6 \text{ s}^{-1}$.

The update was done due to the Riccobono et al. (2014) parameterization being based on more recent research and due to the fact that NPF was too high and lasted too long compared to observations with the Paasonen et al. (2010) parameterization in CAM6-NOR. Note that even though it is likely that the Riccobono et al. (2014) parameterization represents an improvement compared to Paasonen et al. (2010), large uncertainties remain due to the fact that the Riccobono et al. (2014) parameterization was developed based on an ELVOC precursor (pinanediol), rather than actual ELVOC measurements, and that it does not take into account other factors that have been shown to be of importance, like temperature and ammonia (see e.g. Semeniuk and Dastoor, 2018).

The rate at which particles are introduced into the smallest bin, $J_{d_{\min}}$, is still parameterized with Eq. (8) defined above (Lehtinen et al., 2007), but with $d_{\text{form}} = d_{\min}$ so that the cut-off size is smaller than before.

2.2.2 Condensation

The condensation is done in the same way as for OsloAero6, except that the calculated loss rate to condensation L_{cond} is now the sum of loss to condensation onto the background modes from OsloAero and the condensation onto the sectional bins, $L_{\text{cond}} = L_{\text{cond,modes}} + L_{\text{cond,sec}}$, in Eqs. (2) and (4). Furthermore, the total gas lost, ΔC , calculated by Eq. (6), is then distributed as follows.

$$f_{\text{nuc}} = \frac{L_{\text{nuc}}}{L_{\text{nuc}} + L_{\text{cond,modes}} + L_{\text{cond,sec}}} \quad (14)$$

$$f_{\text{cond,sec}} = \frac{L_{\text{cond,sec}}}{L_{\text{nuc}} + L_{\text{cond,modes}} + L_{\text{cond,sec}}} \quad (15)$$

$$f_{\text{cond,modes}} = \frac{L_{\text{cond,modes}}}{L_{\text{nuc}} + L_{\text{cond,modes}} + L_{\text{cond,sec}}} \quad (16)$$

Here, $f_{\text{nuc}} + f_{\text{cond,sec}} + f_{\text{cond,modes}} = 1$. In other words, the condensate added to the modes is $C_{\text{lost,tot}} \cdot f_{\text{cond,modes}}$. In the same fashion, condensing mass to the sectional scheme is distributed to the different bins by the strength of their respective condensational sinks,

$$f_{\text{bin}(d_i)} = f_{\text{cond,sec}} \cdot \frac{L_{\text{cond,bin}(d_i)}}{L_{\text{cond,sec}}}, \quad (17)$$

so that the condensate added to any bin, d_i , is equal to $\Delta C \cdot f_{\text{cond,bin}(d_i)}$.

Finally, the condensational growth of particles within the sectional scheme is done in a quasi-stationary structure (Jacobson, 1997), meaning the particles grow in volume but are fitted back onto the full stationary grid between each time step (Jacobson, 2005, Sect. 13.3). This is done by assuming that (1) the total volume is constant before and after the transfer between the bins, and (2) the total number is the same. Let v_i and v_{i+1} be the volume of a particle in bin i and the next bin, $i + 1$, prior to any growth. Let v'_i be the volume of a particle in bin i after growth. Furthermore, let N_i be the number

of particles in bin i prior to growth and ΔN_{i+1} be the number of particles moved to the next bin $i + 1$. Since we do not have any evaporating species, we can easily solve the equation conserving both the number and volume of aerosol for each species:

$$v'_i N_i = v_i (N_i - \Delta N_{i+1}) + v_{i+1} \Delta N_{i+1}, \quad (18)$$

and solving for ΔN_{i+1} gives

$$\Delta N_{i+1} = N_i \cdot \frac{v'_i - v_i}{v_{i+1} - v_i}. \quad (19)$$

After the particle mass is moved in this way, the freshly nucleated particles from the same time step are added to the smallest bin. The rationale behind this is that the nucleated particles in the same time step do not take part in the condensation sink calculation, and thus including them before the redistribution of mass on the sectional grid would only imply adding particles with no added condensate.

The time step within the nucleation and condensation code is locally divided in two compared to the rest of the code (thus 15 min), and if the particles in the sectional scheme grow fast enough to skip a bin, the time step is further divided in two until it is small enough.

2.2.3 Coagulation

In addition to the unchanged coagulation in the original OsloAero scheme (see Sect. 2.1.4), we calculate the coagulation sink of the sectional particles onto all larger particles. This is done in the same way between particles in the original OsloAero scheme, in that a normalized coagulation sink is calculated for each background mode by dividing the size distribution into 44 bins. When sectional particles coagulate with particles in the “modal” scheme, their mass is transferred to the corresponding process tracer for condensate. This is done for simplicity and because the alternative would be to place them in the coagulation tracers – one of the process tracers – in the original scheme, which will only contribute to changes in the larger particles.

In addition to this, coagulation between the particles in the sectional scheme is taken into account. When two particles in the sectional scheme collide, this results in the loss of the particle in the smaller bin and the addition of mass to the particle in the larger bin. After this is done in each time step, the mass in the sectional scheme is redistributed in the same way as after condensation (see previous section).

2.3 Chemistry: changes to oxidant diurnal variation

The oxidant concentrations of the hydroxyl radical (OH), nitrate radical (NO₃), hydroperoxy radical (HO₂) and ozone (O₃) in the model are prescribed by 3D monthly mean fields (see Seland et al., 2020b). On top of this, a diurnal cycle is applied to OH, HO₂ and NO₃. In the default version of the model, the diurnal cycle for OH is basically a step function

based on whether it is before or after sunrise. Since OH in particular is very important for the diurnal cycle of H₂SO₄, this leads to more or less a step function in H₂SO₄ concentrations as well, which is not very realistic in terms of NPF. We therefore implemented a simple sine shape to the daily variation in place of the step function.

3 Model simulations and output post-processing

3.1 Simulation description

In the following analysis we include simulations with three versions of the CAM6-Nor.

- A simulation with OsloAeroSec, referred to simply as “OsloAeroSec” (see Sect. 2.2)
- A simulation with the default version of OsloAero (see Sect. 2.1), referred to as “OsloAero_{def}”
- A simulation with the default version of OsloAero, but with the same changes to the nucleation rate (Eq. 13) and oxidants (see Sect. 2.3) as OsloAeroSec, referred to as “OsloAero_{imp}”

The last simulation, OsloAero_{imp}, is added in order to separate the changes made in OsloAeroSec to the nucleation rate and the diurnal concentration in the oxidants (described above) from the effect of adding a sectional scheme. The simulation characteristics are also summarized in Table 1.

NorESM2 is run with CAM6-Nor (release-noresm2.0.1, <https://github.com/NorESMhub/NorESM>, last access: 28 May 2021; Kirkevåg et al., 2018) coupled to the Community Land Model version 5 (CLM5) (Lawrence et al., 2019) in BGC (biogeochemistry) mode and prognostic crops. We use a 1.9° (latitude) × 2.5° (longitude) resolution grid with 32 height levels from the surface to ~ 2.2 hPa in hybrid sigma coordinates. We use prescribed sea surface temperature (SST) and sea ice concentrations at 1.9 × 2.5° resolution (Hurrell et al., 2008). Simulations are run from 2007 to and throughout 2014 with CMIP6 historical emissions and greenhouse gas concentrations (Seland et al., 2020b) as well as nudged meteorology (horizontal wind and surface pressure) to ERA-Interim (ECMWF, 2011) using a relaxation time of 6 h (Kooperman et al., 2012) (as described in Karset, 2020, Sect. 4.1). The year 2007 is discarded as spin-up. The initial conditions for all simulations are taken from a simulation with CAM6-Nor run from 2000 and throughout 2006.

3.2 Post-processing of model output

All figures, except comparisons to observations (described below), are produced from monthly mean output files from the model. When we present figures showing averaged values over maps, these are either column burdens or “near-surface”

Table 1. Simulation overview. See the detailed description in Sect. 3.

Simulation	Nucleation parameterization	Oxidant treatment	Early growth treatment
OsloAeroSec	$A_3[\text{H}_2\text{SO}_4]^2 \times [\text{ELVOC}]^a$	Improved diurnal variation	Lehtinen et al. (2007) + sectional scheme
OsloAero _{imp}	$A_3[\text{H}_2\text{SO}_4]^2 \times [\text{ELVOC}]^a$	Improved diurnal variation	Lehtinen et al. (2007)
OsloAero _{def}	$A_1[\text{H}_2\text{SO}_4] + A_2[\text{ELVOC}]^b$	Default diurnal variation	Lehtinen et al. (2007)

$A_1 = 6.1 \times 10^{-7} \text{ s}^{-1}$, $A_2 = 3.9 \times 10^{-8} \text{ s}^{-1}$, $A_3 = 3.27 \times 10^{-21} \text{ cm}^6 \text{ s}^{-1}$. ^a Riccobono et al. (2014). ^b Paasonen et al. (2010).

Table 2. Region overview. These regions are used to create vertical average profiles.

Region name	Description	Latitude	Longitude
Continental	Grid boxes with > 50 % land		
Marine	Grid boxes with < 50 % land		
Global			
Polar N		66.5–90° N	180° W–180° E
Polar S		66.5–90° S	180° W–180° E
Amazonas		16° S–2° N	74–50° W

averages of the variable in question. The near-surface averages are calculated as the average of all grid cells below 850 hPa, weighted by the grid cell pressure thickness to account for the mass in the grid cell. Cloud radiative effects and direct radiative effects are calculated as described in Ghan (2013).

For the model-to-model comparisons, we include an analysis of whether the change is significant. Dots are included in the plots to indicate where the difference between the two models is significant with a two-tailed paired Student’s *t* test with a 95 % confidence interval.

When we compare the model runs, we compare the model version with and without an explicit treatment of the smallest particles. We therefore introduce the following subgroups of particle number concentration. We refer to particle number concentrations excluding particles in the sectional scheme as N_a . This includes all the particles for the OsloAero simulations (OsloAero_{def} and OsloAero_{imp}) but excludes the particles still in the sectional scheme for OsloAeroSec. Furthermore, the total number of aerosols we refer to as N_{tot} , and the concentration of aerosols in the sectional scheme will be referred to as N_{sec} . Finally, the aerosol scheme also tracks the number of particles in the modal scheme originating from NPF, and this we denote as N_{NPF} . This is summed up in Table 3. Note that changes in N_{NPF} and N_a in general follow the same patterns because we do not introduce changes to particles other than those from NPF.

3.3 Processing of model output data prior to comparison with observations

We compare the nudged model simulations for the years 2008 and 2009 to observed size distributions from the EU-SAAR dataset from Asmi et al. (2011a). The dataset con-

tains time series of hourly data for number concentrations of particles with diameters between 30 and 50 nm (N_{30-50}), 50 and 500 nm (N_{50-500}), 100 and 500 nm ($N_{100-500}$), and finally 250 and 500 nm ($N_{250-500}$). In this study, we focus on the concentration of particles with diameters between 50 and 100 nm, i.e. $N_{50-100} = N_{50-500} - N_{100-500}$. Throughout the simulation period, we output hourly mean values describing the modelled size distribution.

The model outputs a log-normal fitting to the size distribution in terms of parameters for 12 log-normal modes. In other words, the total size distribution is

$$\frac{dN}{d(d_p)} = \sum_i^{12} \frac{dN_i}{d(d_p)}. \tag{20}$$

Each term $\frac{dN_i}{d(d_p)}$ is furthermore defined in terms of output parameters from the modal number median diameter, $d_{m,i}$, geometric standard deviation, S_i , and the number concentration in the mode, N_i :

$$\frac{dN_i}{d(d_p)} = \frac{N_i}{d_p \log(S_i) \sqrt{2\pi}} \exp\left(-\frac{(\log(d_p) - \log(d_{m,i}))^2}{2 \log(S_i)}\right). \tag{21}$$

For each mode, we can then calculate the number of particles in a size range from diameter d_1 to d_2 by

$$N_{i,d_1-d_2} = N_i(d < d_2) - N_i(d < d_1), \tag{22}$$

where N_i is the cumulative distribution function of the distribution in Eq. (21), and thus

$$N_i(d < x) = \frac{1}{2} + \frac{1}{2} \text{erf}\left[\frac{\log(x) - \log(d_{m,i})}{\sqrt{2 \log(S_i)}}\right]. \tag{23}$$

The total number concentration in a size range is thus $N_{d_1-d_2} = \sum_{i=1}^{12} N_{i,d_1-d_2}$. We calculate these variables for

Table 3. Model variable definitions.

Variable name	Definition
N_a	Number of particles excluding those in the sectional scheme
N_{tot}	Number of particles including those in the sectional scheme
N_{sec}	Number of particles in the sectional scheme
N_{NPF}	Number of particles from NPF excluding those in the sectional scheme
$N_{d_1-d_2}$	Number of particles with diameter d such that $d_1 \leq d \leq d_2$
N_{d_1}	Number of particles with diameter d such that $d_1 \leq d$

each hour and compute further statistics from the result. By using such a fine time resolution, we avoid a common imprecision arising when averaging the parameters of the size distribution, $r_{m,i}$ and S_i , over a longer time period (i.e. monthly output).

Furthermore, for the comparison of size distributions, we calculate $\frac{dN}{d\log(d_p)} = d_p \frac{dN}{d(d_p)}$ for an array of diameters and compute further statistics from the hourly values.

4 Results and discussion

4.1 Comparison to EUSAAR dataset

In this comparison we focus on N_{50-100} because particles smaller than 50 nm are unlikely to be relevant for CCN and particles above 100 nm are less effected by the changes to the NPF scheme (see e.g. the size distributions in Fig. 4).

Figures 2 and S4 in the Supplement show the distribution of the modelled minus the observed values for N_{50-100} at hourly resolution and with all valid station data included.

From Fig. 2 we can see a clear improvement with OsloAeroSec compared to both OsloAero_{def} and OsloAero_{imp}. The improvement is most pronounced in summer, when OsloAero_{def} and OsloAero_{imp} overestimate N_{50-100} , while it is also clear in autumn and spring. It is also encouraging that OsloAeroSec has a clear decrease in the times when the number concentration is highly overestimated, while there is not a similar increase in times when it is underestimated. Furthermore, we see that changes to nucleation parameterization and diurnal variation in oxidants in OsloAero_{imp} reduce the bias compared to OsloAero_{def}. In winter, NPF is low, so we see little difference between the different schemes. Figure S4 shows the same as Fig. 2 but for each individual station. OsloAeroSec (OsloAeroSec) shows improvement against OsloAero (OsloAero_{def} and OsloAero_{imp}) in most stations during JJA, while sometimes underestimating N_{50-100} in MAM (e.g. VHL, MPZ, HWL).

The annual variability of both models and observations is shown in Fig. 3, where the monthly median (solid line) and percentiles (16th to 84th) are plotted for each station. Again it is clear that OsloAeroSec in general reduces the high bias of OsloAero_{def} and OsloAero_{imp}, especially when the bias is very high (e.g. OBK, HPB, FKL, ZSF, CMN,

BEO). The exceptions that stand out are e.g. CBW, JRC, ZEP and KPO, where all versions of the model do rather poorly in both absolute numbers and in terms of representing the annual variability. This might indicate that aerosol or precursor emissions in the model are not accurate e.g. due to local sources that are unaccounted for in the model. For CBW, NPF should not be an important source of aerosols during winter and autumn (Mamali et al., 2018), so it is likely that other aerosols are responsible for the underestimation during these seasons. Dall'Osto et al. (2018) note a strong influence of local anthropogenic emissions at this station, which is likely not captured in the CMIP6 emissions. However, during summer, the model may well show an underestimation of production of particles from NPF, which becomes slightly worse with OsloAeroSec. According to Dall'Osto et al. (2018), NPF should be most frequent in JRC and KPO during spring, which the N_{50-100} does not really reflect, probably due to other particles dominating the annual variability. Furthermore, at ZEP station, the concentrations are underestimated in all months except late autumn and winter. At this station the concentrations in the sectional scheme (see Figs. 4 and S12–S15 in the Supplement) reveal that there are relatively many particles forming at this location, but they do not survive to 50 nm. All models perform badly here, with OsloAeroSec and OsloAero_{imp} performing slightly worse than OsloAero_{def}. In PLA and WAL, the OsloAeroSec results in values that are too low, while OsloAero_{def} and OsloAero_{imp} perform better. In station MHD, FKL, ZSF, CMN and BEO, the model overestimation of N_{50-100} is reduced in OsloAeroSec but is still significantly too high.

The normalized root mean square error (NRMSE) is improved with OsloAeroSec for both N_{50-100} and N_{50-500} , while it stays more or less the same for $N_{100-500}$. The NRMSE is shown in Fig. S5 in the Supplement and is calculated for each season and each model version using hourly resolution and all available data. The greatest improvement is seen in N_{50-100} and in summer, followed by SON and MAM, while DJF is mostly unchanged. N_{50-500} shows improvement in the same seasons, while there only small improvements in prediction skill for $N_{100-500}$. The lack of change in prediction skill for particles larger than 100 nm likely originates from the fact that in CAM6-Oslo, the NPF particles no not

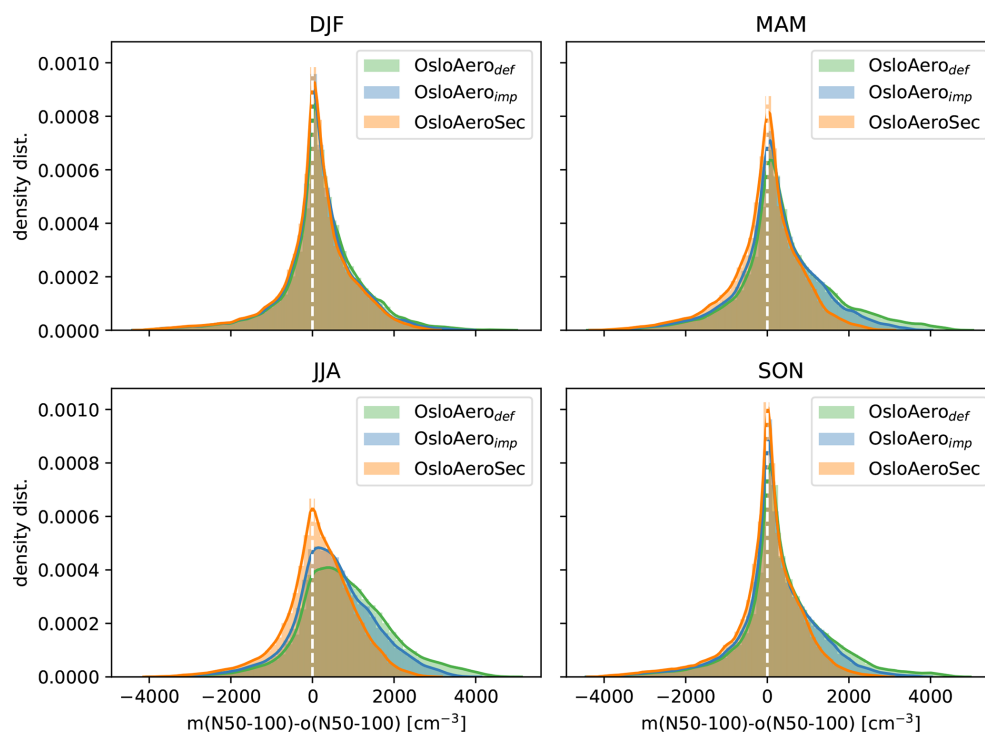


Figure 2. Seasonal distribution of modelled N_{50-100} minus observed N_{50-100} for all EUSAAR stations (Asmi et al., 2011a). We use hourly resolution, and all available station data are included.

change mode by condensational growth – rather, the whole mode grows in number median diameter. Thus, the variability in concentrations of particles larger than 100 nm is dominated by primary particle emissions, which we do not alter here.

Even though the N_{50-100} improves, Fig. 4 reveals that the concentrations at smaller sizes are overestimated in most locations. The figure shows the size distribution of particles at each station from both observations and the three versions of CAM6-Nor. For the sectional scheme, the distribution is the sum of particles in the sectional scheme and the modal scheme. This is why it has “spikes” and why there is often a large reduction in $dN/d\log_{10}D$ at the intersection between the sectional scheme and the modal scheme, which might be misunderstood to mean that disproportionately many particles are lost in the transition between the sectional and modal scheme. The distribution in the sectional scheme, without adding the modal particles, is shown by the dashed line. One important reason why the sectional scheme overestimated the number of the particles at the smallest sizes may be that the number of particles above ~ 100 nm is underestimated in all the model versions in most of the stations (see e.g. the distribution of particle surface areas in Fig. S11 in the Supplement).

This is particularly pronounced in summer, when the number of particles in the sectional scheme is particularly high (see Fig. S13). Since NPF mostly influences nucleation and

Aitken-mode particles, this is likely due to other aerosol sources not being adequately represented in the model. This leads to an underestimation of coagulation sink and hence an overestimation of the formation rate. To the same effect, the condensation sink may be too low, again leading to too many new particles forming. This is particularly clear in the Arctic station Zeppelin (ZEP), where the measurements show a peak in particles between 100 and 200 nm, which are completely missing in the models. The combination of an overly high formation rate and a slow condensation growth rate leads to too many particles in the smaller sizes.

Overall, adding the explicit treatment of the smaller particles in OsloAeroSec does improve the representation of CCN relevant particles in the model. We especially get a reduction in number concentrations of diameters above 50 nm at which they are significantly overestimated.

4.2 Comparison to original model

The following section will present general differences in OsloAeroSec compared to the two versions of the original model, OsloAero_def and OsloAero_imp. For this analysis, we make use of the full global model output in monthly mean resolution. We will start by comparing the particle number concentrations and properties of the aerosols. The original version of the CAM6-Nor aerosol scheme does not explicitly model the smallest particles, so in order to get an apples-to-apples comparison, we focus on properties relevant for

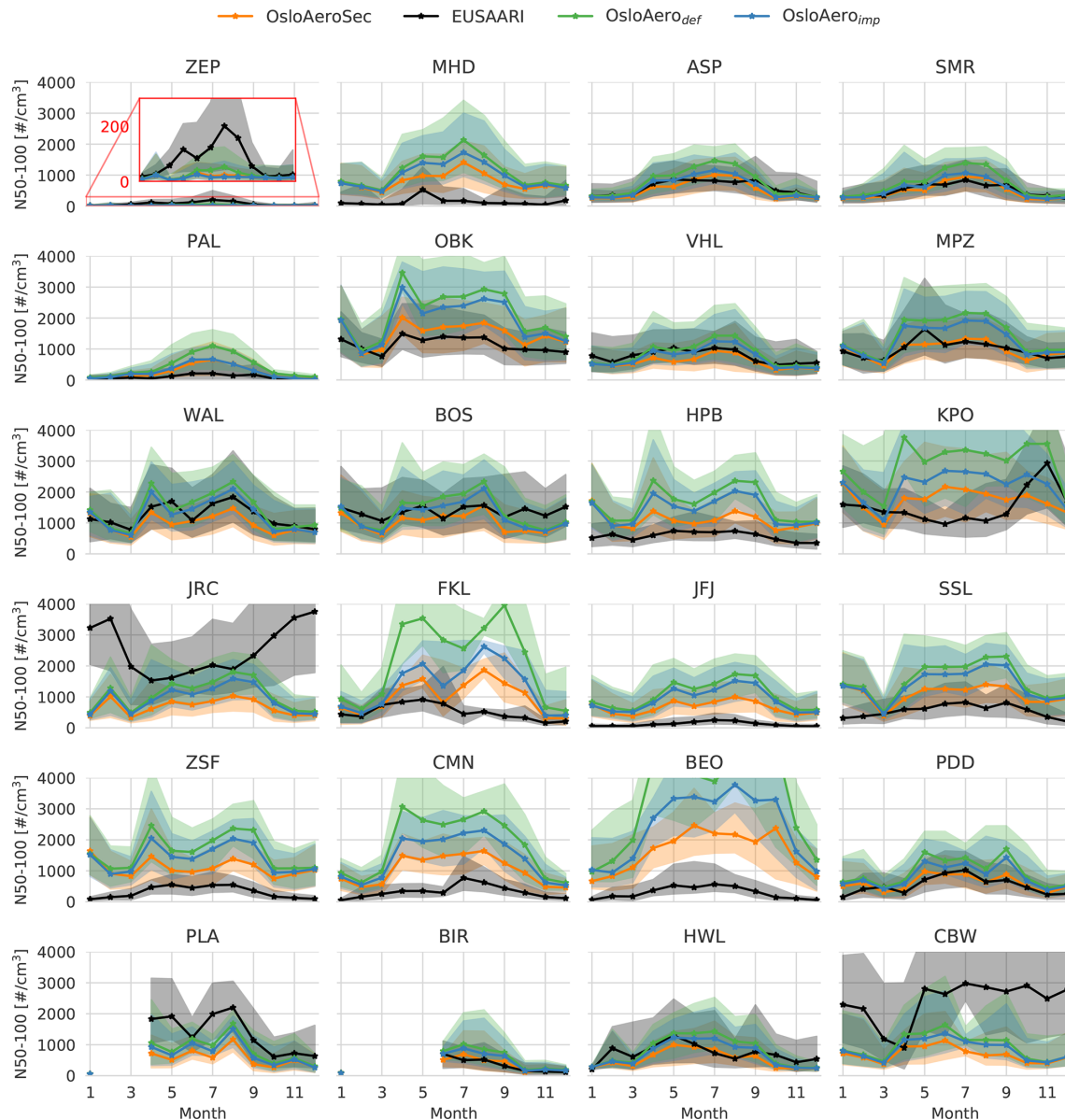


Figure 3. N_{50-100} monthly median (solid line) and percentiles (shaded, 16th to 84th) for each station for each model version and the observed values (Asmi et al., 2011a). Stations where the full graph is not shown due to the axis limits are shown in full in Fig. S6 in the Supplement. Zeppelin (ZEP), Mace Head (MHD), Aspöretten (ASP), SMEAR II (SMR), Pallas (PAL), Kosetice (OBK), Vavihill (VHL), Melpitz (MPZ), Waldhof (WAL), Bösel (BOS), Hohenpeissenberg (HPB), K-Puszt (KPO), JRC-Ispira (JRC), Finokalia (FKL), Jungfraujoch (JFJ), Schauinsland (SSL), Zugspitze (ZSF), Monte Cimone (CMN), BEO Moussala (BEO), Puy de Dôme (PDD), Preila (PLA), Birkenes (BIR), Harwell (HWL), Cabauw (CBW).

climate, as represented by the modal aerosol scheme when comparing OsloAeroSec to OsloAero_{def} and OsloAero_{imp}. See Table 3 for a summary of the definitions of the variables defining number concentration. We then proceed to changes in cloud properties and finally the radiative effect.

4.2.1 Aerosols

The total number of particles, N_{tot} , increases in OsloAeroSec compared to OsloAero_{def} and OsloAero_{imp} due to the addition of particles not explicitly treated before. In Fig. 5 the absolute number of sectional particles, N_{sec} , in OsloAeroSec is shown (a and c) together with the total number of particles, N_{tot} (right, b and d). The maps in Fig. 5a and b show near-surface averages, as defined in Sect. 3.2. As can be

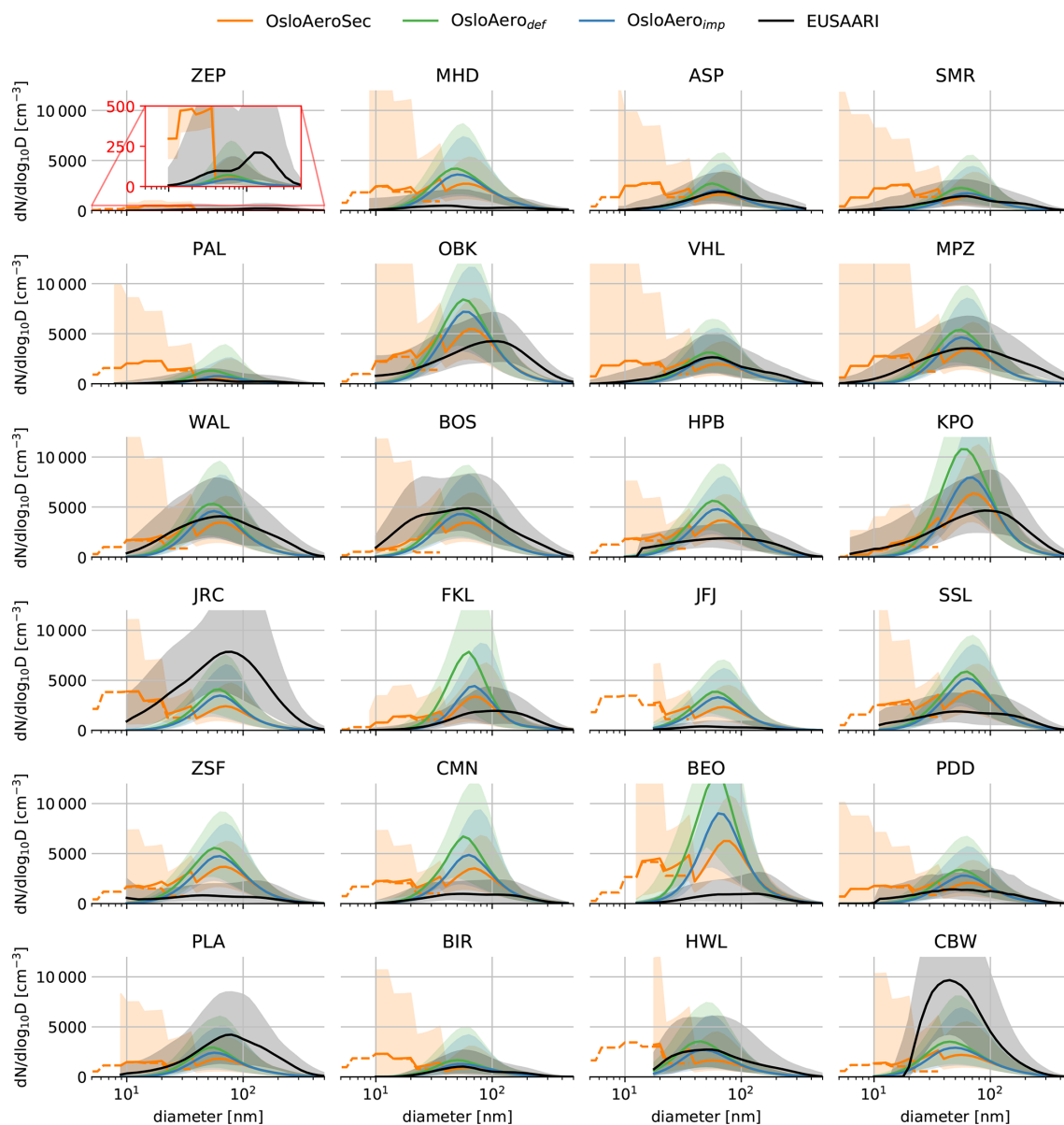


Figure 4. Median (solid line) particle number size distribution and shading from the 16th to 84th percentiles for observations (Asmi et al., 2011a) and models. All data when and where observations are available are included.

seen from Fig. 5d, the change is particularly strong in the upper troposphere, where N_{tot} is very low in OsloAero_{imp} and OsloAero_{def} because the smallest particles are simply not represented in these model versions.

Figure 6a shows averaged profiles of N_a for each model version, while Fig. 6b and c show maps of the near-surface relative difference in OsloAeroSec compared to OsloAero_{def} and OsloAero_{imp}, respectively. On average, the global near-surface N_a decreases in OsloAeroSec by 15 % compared to OsloAero_{imp} and 36.2 % compared to OsloAero_{def}. However, at high latitudes the change relative to OsloAero_{imp} is small, or positive, especially over the Southern Ocean. When considering the vertical change shown in Fig. 6a, OsloAeroSec

has fewer particles close to the surface, while the difference is reduced further up in the atmosphere. In the free troposphere, i.e. further away from the surface, the difference becomes positive and OsloAeroSec lets more particles survive through early growth. For the global average this happens roughly at 700 hPa, while over ocean it happens at 800 hPa. Over the continents, OsloAero_{imp} is always higher, though the difference decreases with height. From these results, we can conclude that on average the sectional scheme produces more particles in more remote regions both horizontally and vertically.

In all model versions, the growth of the particles from nucleation to the smallest mode happens by condensa-

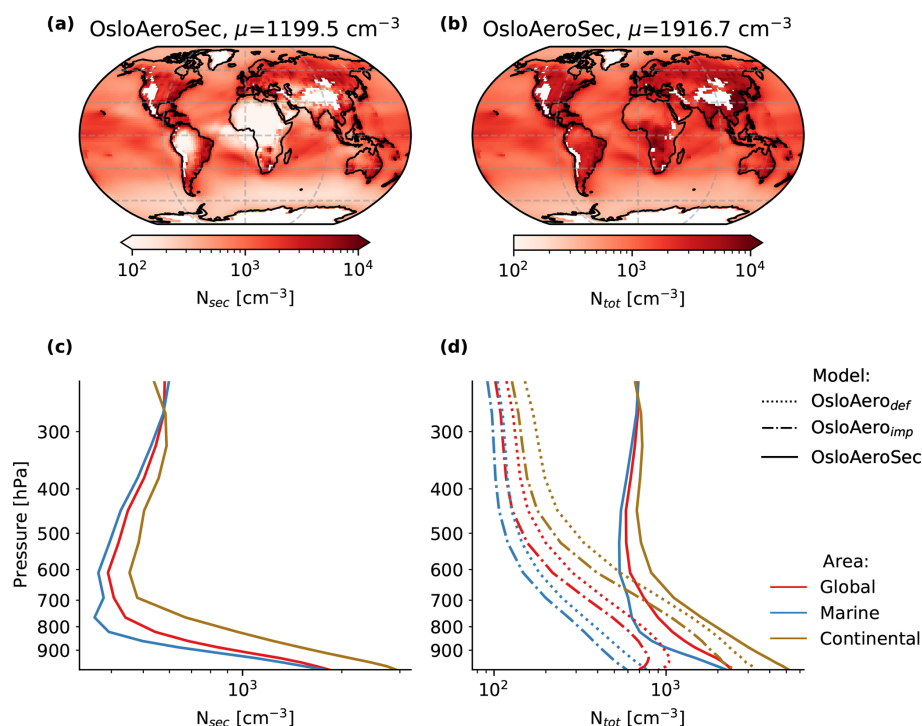


Figure 5. Modelled particle number concentrations. Panels (a) and (b) show maps of the near-surface average concentrations for N_{sec} (a) and N_{tot} (b) in OsloAeroSec. Panels (c) and (d) show average profiles globally, over continents (continental) and over ocean (marine) for N_{sec} (c) and N_{tot} (d). In (d), OsloAero_def and OsloAero_imp are also included.

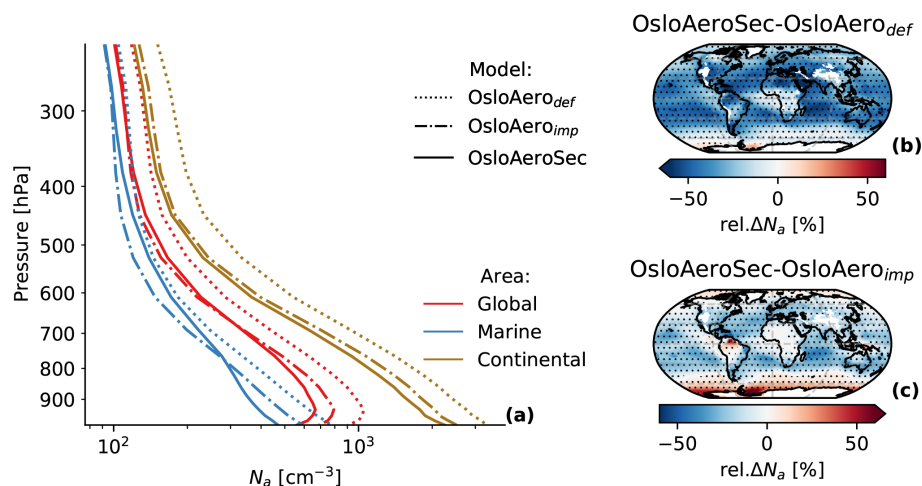


Figure 6. Comparison of N_a from OsloAero_def and OsloAero_imp to OsloAeroSec. (a) Profiles of the mean of regions (global, marine and continental) for the model versions. (b, c) The relative difference in the near-surface mean of OsloAeroSec compared to OsloAero_def and OsloAero_imp, respectively. Areas where the difference is significant (95 %) are marked with dots.

tion of the two tracers H_2SO_4 and SOAG_{LY} . The relative contribution of H_2SO_4 and SOAG_{LY} to this growth changes with OsloAeroSec but, interestingly, also between OsloAero_def and OsloAero_imp. Figure 7a shows the secondary organic aerosol (SOA) fraction of the particles that have survived to the modal scheme averaged over regions. Firstly, the SOA fraction goes down in OsloAero_imp com-

pared to OsloAero_def, and secondly, globally it goes up with OsloAeroSec. We start by exploring the difference between OsloAero_def and OsloAero_imp. These two simulations have the same parameterization for survival of particles from nucleation up to the model scheme (see Sect. 2.2), but OsloAero_imp has an improved diurnal variation in the oxidants, resulting in a higher diurnal peak in H_2SO_4 (not

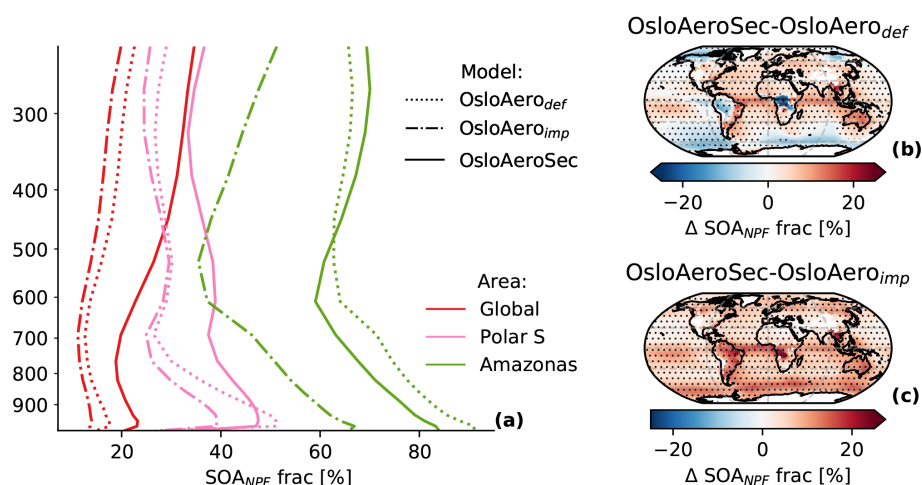


Figure 7. The SOA fraction of N_{NPF} mass (SOA_{NPF}), i.e. the fraction of the growth of the particles before they reach the modal scheme, which is due to organics. **(a)** Profiles for regions (global, polar south, Amazonas) with each model. **(b, c)** The difference in the near-surface mean values for OsloAeroSec minus OsloAero_{def} and OsloAero_{imp} (c), respectively. Areas where the difference is significant (95 %) are marked with dots.

shown). Additionally, the nucleation parameterization in OsloAero_{imp} is of the form $H_2SO_4^2 \times ELVOC$, meaning that as H_2SO_4 increases, the nucleation rate increases to the power of 2, while in OsloAero_{def} the increase is linear with both H_2SO_4 and ELVOC. Furthermore, because the growth from the nucleation to modal scheme happens within one time step in these simulations, the fraction of growth from SOA is entirely based on H_2SO_4 and ELVOC at the moment of nucleation. This means that if most of the particles form when H_2SO_4 is at its highest, H_2SO_4 will also dominate the post-nucleation growth. This explains the reduced contribution of SOA in OsloAero_{imp} relative to OsloAero_{def}.

The change seen in OsloAeroSec compared to OsloAero_{def} and OsloAero_{imp}, on the other hand, can be explained by two factors: (1) though OsloAeroSec has the same changes to oxidants and nucleation parameterization as OsloAero_{imp}, the particles grow in the sectional scheme over more than one time step and are thus exposed to different concentrations of H_2SO_4 and SOAG_{LV}. Thus, the concentrations at the time of nucleation will be less dominant for the growth. (2) In OsloAero_{def} and OsloAero_{imp} only ELVOC, which is 50 % of the SOAG_{LV}, will contribute to growing the particles up to the modal scheme, while in OsloAeroSec 100 % of the SOAG_{LV} can contribute after the particles have reached the sectional scheme (5 nm), thus increasing the SOA fraction. The result is a combination of these effects; in some regions, like over the Amazon, the effect seems to be dominated by the change in nucleation timing such that the SOA fraction goes down compared to OsloAero_{def}. In most regions the effect is that the SOA fraction increases.

Note that the changes in hygroscopicity from this are minor and mitigated by the fact that additional condensate is added to the particles after they reach the modal scheme.

The strength and sign of the change in number concentration between OsloAeroSec and the original model vary with location.

To investigate what conditions lead to the changes in NPF particles, we focus on the difference in N_{NPF} between OsloAeroSec and OsloAero_{imp} and analyse its relationship to relevant variables in OsloAero_{imp}. Thus, we can analyse under which conditions in the model (polluted, clean, high NPF etc.) N_{NPF} increases or decreases with the sectional scheme. Figure 8 shows the relationship for nucleation rate (J_{nuc} , a), growth rate (GR, b), H_2SO_4 (c), SOAG_{LV} (d), N_{NPF} (e) and coagulation sink for newly formed particles (CoagS, f). This 2D histogram includes each grid cell below 100 hPa, and monthly mean values are used for each grid cell.

Firstly, most of the variables show a branch with a strong negative relationship with the change in N_{NPF} (ΔN_{NPF}). Further investigation shows that the grid cells that constitute this branch are mainly close to the surface and, as can be seen from Fig. 8e, where N_{NPF} and CoagS are high. In other words, what we are seeing is that in regions with high CoagS and N_{NPF} , the sectional scheme drastically reduces the number of particles that survive and reduces it more the higher they were initially in OsloAero_{imp}. This resembles what we saw when comparing to station data, with the very high overestimations particularly reduced.

For the other grid cells, in which N_{NPF} and CoagS are lower, there is another branch showing a positive relationship with GR, H_2SO_4 and SOAG_{LV}. From panels (e) and (f), it is clear that these grid cells have N_{NPF} concentrations under roughly 100 cm^{-3} and CoagS under roughly 10^{-3} h^{-1} . In this regime the sectional scheme allows more particles to survive, and condensational growth is more important.

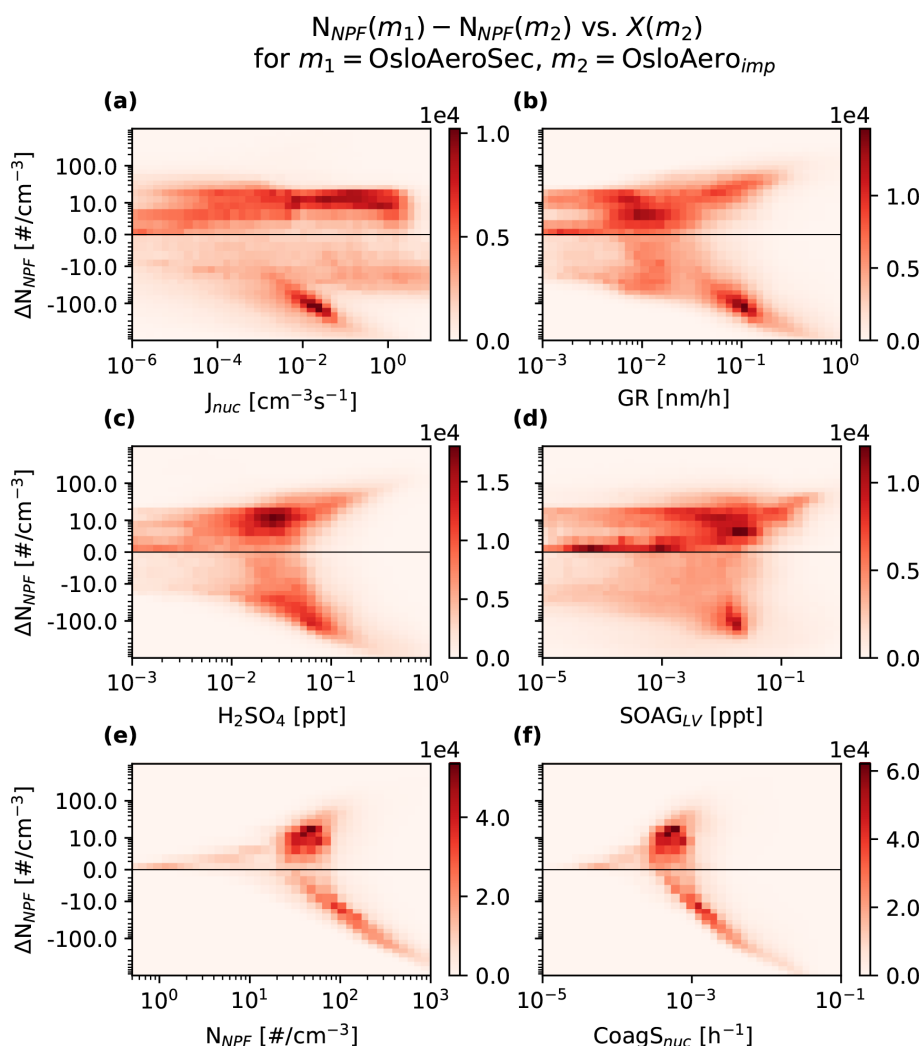


Figure 8. Two-dimensional histogram of the relation between various factors in the original model run OsloAero_{imp} and the change in the number of particles from NPF (N_{NPF}) between OsloAeroSec and OsloAero_{imp} . The colour shows the number of model grid cells which fall within the x – y range using monthly mean files. Only grid cells below 100 hPa are included. The values on the x scale are the nucleation rate (a), the growth rate of newly formed particles (b), the mixing ratio of H_2SO_4 (c), the mixing ratio of SOAG_{LV} (d), the concentration of particles from NPF (e) and the coagulation sink for newly formed particles (f). See Fig. S17 in the Supplement for the same plot, but with N_{NPF} from OsloAero_{imp} , i.e. not the change.

In sum this means that in regions with very high number concentrations initially, the sectional scheme reduces the number of particles that survive proportional to the coagulation sink and the initial number of particles, while when the number of particles is initially small, the sectional scheme lets more particles survive and the change is more proportional to the concentration of condensing vapours.

As mentioned before, the Lehtinen et al. (2007) parameterization assumes steady-state GR and CoagS throughout the growth up to the aerosol model cut-off diameter, while in reality aerosol often forms e.g. when the GR is high and the CoagS is relatively low. The steady-state assumption is likely to give especially biased results in areas with high variability in aerosol and precursor concentrations. Since this is

especially the case in areas with a high aerosol concentration, like the boundary layer, this may be why it is especially here that the sectional scheme reduces N_{NPF} . In the sectional scheme, the particles may grow over some time and space before reaching the modal scheme and thus experience other concentrations.

4.2.2 Cloud–aerosol interactions

The sectional scheme affects the CCN concentrations by influencing the number of particles that survive to the modal scheme and thus also influences the cloud droplet activation scheme. The changes to cloud properties are shown in Figs. 9e–h and 10. We include variables that indicate changes

to cloud properties from cloud–aerosol interaction. Unfortunately, CCN calculations are not currently available for CAM6-Nor.

We start by discussing the changes in OsloAeroSec compared to OsloAero_{imp} shown in the right column of Figs. 9 and 10. Figure 9f and h show the change between OsloAeroSec and OsloAero_{imp} in cloud droplet number concentration (CDNC) and r_e averaged over longitude and time. These plots reveal that the CDNC increases and r_e decreases at most latitudes and heights, except above $\sim 40^\circ$ N.

Considering the change in N_{NPF} shown in Fig. 9b, the change in cloud properties reveals a highly non-linear response in Fig. 9f; the CDNC increases (and similarly r_e decreases) both where there are more NPF particles (N_{NPF}) (high in the Southern Hemisphere atmosphere) and where there are fewer (near the surface in the tropics). To investigate this, we show in Fig. 11a and b the Pearson correlation coefficient between ΔN_{NPF} and ΔCDNC calculated for each latitude and pressure level along time (monthly mean) and longitude. The pattern shows that in remote regions, i.e. polar and high troposphere, higher N_{NPF} is positively correlated with higher CDNC, while in less remote regions, the opposite is the case. The correlations are very similar when comparing to OsloAero_{def} (Fig. 11a) and OsloAero_{imp} (Fig. 11b). These regions correspond roughly to regions of low particle concentrations (upper atmosphere) and high particle concentrations (surface). The reason for these correlations is likely that when the number of particles decreases, the amount of condensate available for each particle increases, thus increasing the number median diameter of each mode. This is seen in Fig. 9b and d, where we have inverse patterns in the difference in N_{NPF} and number median radius for NPF particles (NMR_{NPF}). Since decreasing the number of particles in general causes the remaining particles to be larger, there may be fewer particles in total, but a larger fraction of the ones that are left is likely to activate. In polluted regions, there are many particles which compete for the same water vapour independently of which NPF scheme is used. The maximum supersaturation will therefore be lower, and the minimum activation diameter will be higher, than in remote regions, assuming all else to be equal. Therefore, the NPF particles may be less likely to activate in polluted regions anyway, and the change in size of the larger particles with NPF will be what governs the change in CDNC.

In more remote regions, the maximum supersaturation will be higher and the activation diameter smaller. Thus, the NPF particles will be more likely to activate directly, and changes to CDNC will be governed by changes in the absolute number of particles rather than the change in the size of the particles.

Keeping this in mind, the cloud property changes are easier to explain. When the number concentration decreases in remote regions, the CDNC (r_e) increases (decreases) and the opposite for non-remote regions.

In general these results are reflected in Fig. 10, showing the changes in cloud properties on maps. There are significant differences over large parts of the high-latitude regions and the Amazon: an increase in column-integrated cloud droplet number ($\text{col}_{\text{droplets}}$, b), a decrease in cloud-top effective droplet radius ($r_e(\text{CT})$, d) and an increase in total cloud water path (CWP, f). Note that there is a reverse pattern over the continental Northern Hemisphere, where $\text{col}_{\text{droplets}}$ decreases, $r_e(\text{CT})$ increases and CWP decreases.

The difference in N_{NPF} between OsloAeroSec and OsloAero_{def} in Fig. 9a shows a stronger and more prevalent decrease than the difference between OsloAeroSec and OsloAero_{imp} in Fig. 9b due to the fact that OsloAero_{def} has, in general, more particles than OsloAero_{imp}.

The cloud effects closely follow the same rationale as for OsloAeroSec vs. OsloAero_{imp}, explained above: the decrease in polluted regions (tropics, close to the surface) brings an increase in CDNC, while a decrease in remote regions (Northern Hemisphere, free troposphere) brings a decrease in CDNC.

The right column in Fig. 10 shows maps for the relative difference between OsloAeroSec and OsloAero_{def}. In this case the hemispheric asymmetry is clearer than for OsloAeroSec vs. OsloAero_{imp}: in the Northern Hemisphere above $\sim 30^\circ$, we have a decrease in $\text{col}_{\text{droplets}}$ (a), r_e clearly increases (c), CWP decreases (e) and the net cloud effect is a slight warming (g). Over the South Pole and large parts of the tropics, the opposite is the case.

The result is that the cloud effects of particles from NPF may depend highly on where these are formed.

4.2.3 Radiative effects

The changes in cloud properties discussed in the section above entail changes to the net cloud radiative effect (NCRE), shown in Fig. 10g and d. The globally averaged NCRE becomes more negative with OsloAeroSec compared to both OsloAero_{def} (-0.05 W m^{-2}) and OsloAero_{imp} (-0.11 W m^{-2}). The globally averaged ΔNCRE is less negative for OsloAeroSec–OsloAero_{def} because there are quite strong compensating positive values in the northern middle to high latitudes.

Aerosols can scatter or absorb radiation directly, and this effect is referred to as the direct aerosol effect. OsloAeroSec can affect the climate not only through changes in the cloud radiative effect, but also to a lesser extent through changes in the direct aerosol effect. We calculate the direct aerosol effect with the method of Ghan (2013). The change in direct aerosol radiative effect (DRE) is shown in Fig. 12. In general the change is small, with up to $\pm \sim 0.4 \text{ W m}^{-2}$ regionally and 0.03 and 0.02 W m^{-2} globally, compared to OsloAero_{def} and OsloAero_{imp}, respectively. This is because the influence of the sectional scheme on the particles large enough to interact directly with radiation is rather small. What we do see is likely due to the fact that when number concentrations de-

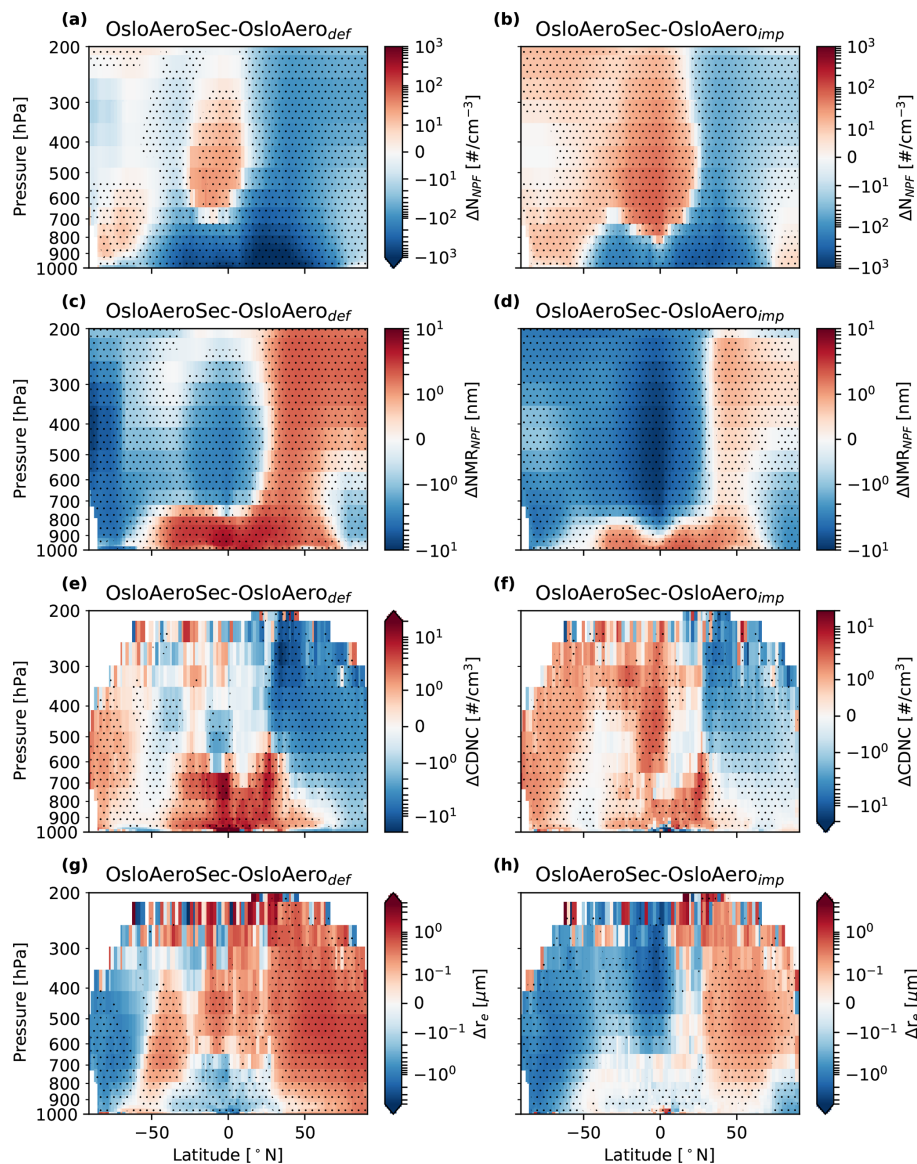


Figure 9. Zonally averaged change between OsloAeroSec and OsloAero_{def} (a, c, e, g) and between OsloAeroSec and OsloAero_{imp} (b, d, f, h) in N_{NPF} (a and b), the number median radius for NPF particles (NMR_{NPF} , c and d), cloud droplet number concentration (CDNC, e and f) and cloud droplet effective radius (r_e , g and h). Areas where the difference is significant (95 %) are marked with dots.

crease (increase), we get an increase (decrease) in condensate available for each particle. Thus, more (fewer) particles grow into the range in which they can interact directly with radiation. This is illustrated by the top two rows in Fig. 9, showing the N_{NPF} and number median radius of the NPF particles which have inverse patterns, as was also seen in Sporre et al. (2020).

4.3 Sensitivities to sectional scheme assumptions

To investigate how sensitive the scheme is to the setup, we performed several sensitivity tests whereby we varied both the number of bins in the scheme and the time step. These

are presented in Sect. 1 in the Supplement. The sensitivity to the time step is low and changes the number of particles originating from NPF by less than 2 %. The sensitivity to the number of bins is slightly higher, with a 7 %–8 % increase in NPF particles when the number of bins is increased from five to eight, indicating that numerical diffusion plays some role. Reducing the number of bins to three decreases the NPF particle concentration by approximately 12 %, indicating that reducing the number of bins is unwise. These tests also indicate the strength of the numerical diffusion because it is known to decrease with increasing resolution in the bins. These tests indicate that numerical diffusion does play some role. On the other hand, increasing the number of bins from

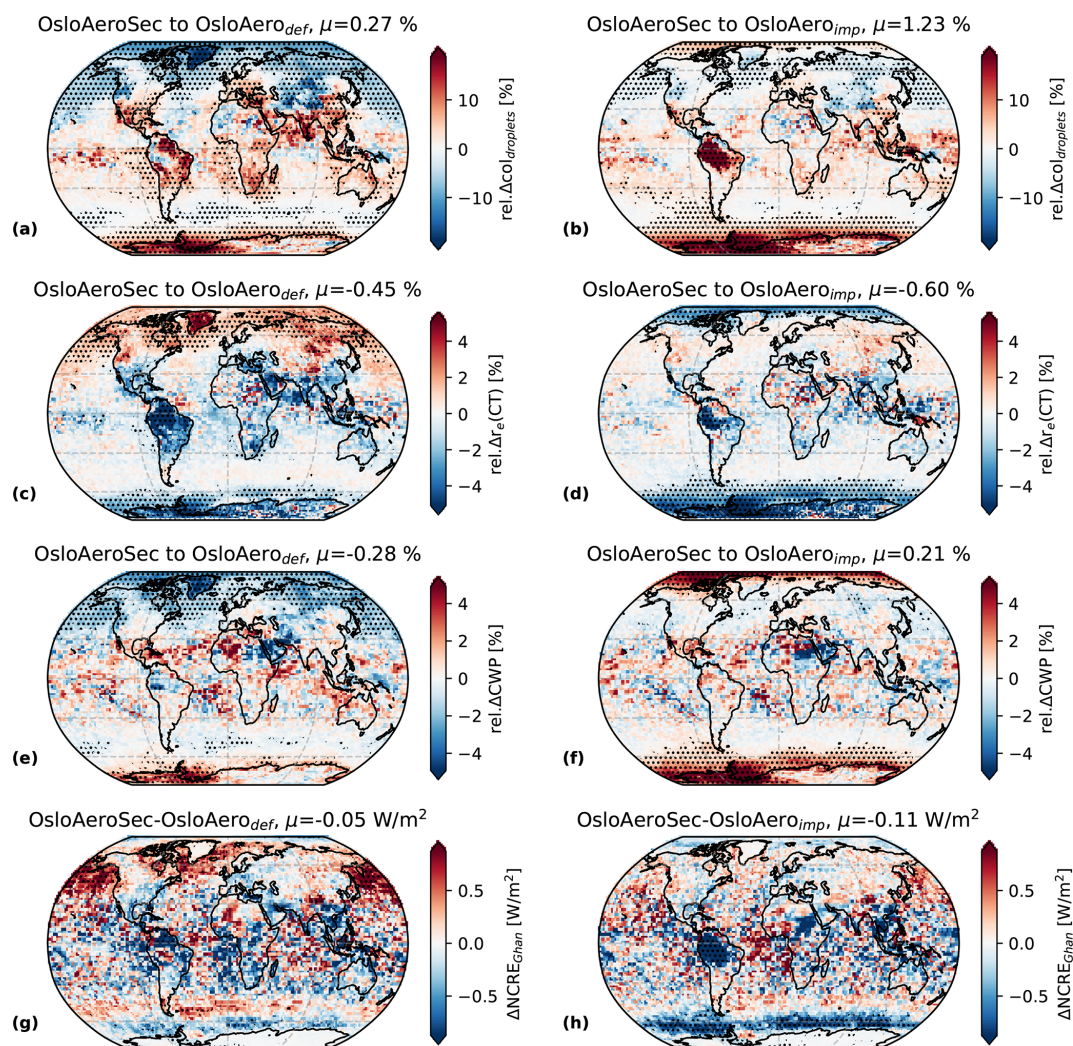


Figure 10. Changes to cloud properties. Panels (a, c, e, g) show the difference between OsloAeroSec and OsloAero_{def} and panels (b, d, f, h) show the difference between OsloAeroSec and OsloAero_{imp}. Panels (a) and (b) show the relative difference in cloud-top droplet number concentration (CDNC(CT)), panels (c) and (d) show the relative difference in effective droplet radius at cloud top ($r_e(CT)$), panels (e) and (f) show the relative difference in cloud water path (CWP), and finally panels (g) and (h) show the difference in net cloud radiative effect (NCRE) calculated as recommended in Ghan (2013). Areas where the difference is significant (95 %) are marked with dots.

five to eight results in a 15 % increase in computational cost, illustrating the need to balance accuracy and keeping computational costs low in ESMs.

5 Implications and further discussion

From the results above, it is clear that including explicit treatment of the early growth in OsloAeroSec does increase prediction skill compared to the original parameterization for particles above 50 nm in diameter. The difference is largest in summer, when the sectional scheme reduces the number of particles in N_{50-100} substantially, bringing it closer to the observed values. While the overestimation of particles above 50 nm is vastly reduced with OsloAeroSec, there is still a

considerable overestimation of the smallest particles (below ~ 20 nm). This indicates that NPF is either too high or too frequent in the model, and this is probably linked to the models having too few larger particles (above ~ 100 nm) and thus a coagulation sink that is too low. Furthermore, the underestimation of the larger particles also leads to less available surface area and a condensation sink that is too low, which may lead to overly high concentrations of H_2SO_4 and/or SOAG_{LV} and thus nucleation rates that are too high.

Our results also go in line with Lee et al. (2013) and Olenius and Riipinen (2017), who show that a higher cut-off diameter leads to overprediction of the aerosol number concentration. They remark that the most likely explanation is the steady-state assumption used in the parameterizations (in our case Lehtinen et al., 2007). We consider this to be the

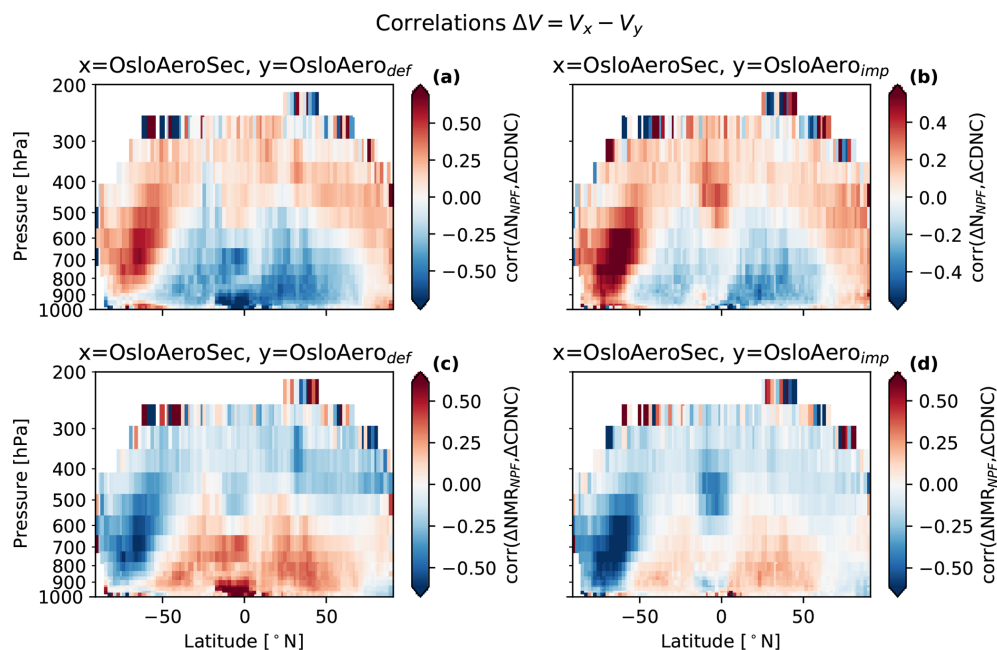


Figure 11. Correlations of the change in CDNC and N_{NPF} (a, b) with the number median radius of the NPF particles (NMR_{NPF}) (c, d). Plots on the left side are for the difference OsloAeroSec – OsloAero_{def} ($\Delta V = V_{\text{OsloAeroSec}} - V_{\text{OsloAero}_{\text{def}}}$ for variable V), and plots on the right are for OsloAeroSec – OsloAero_{imp}.

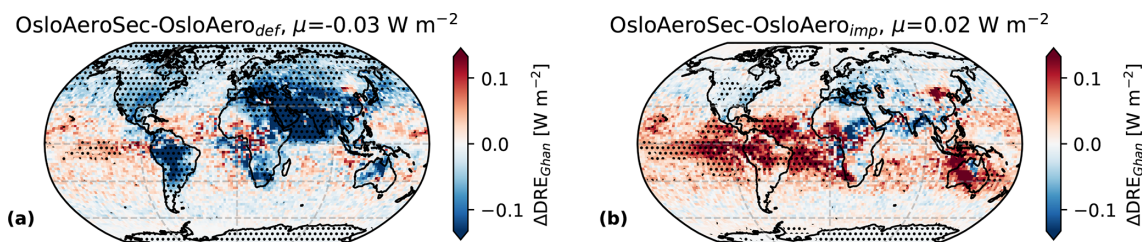


Figure 12. Change in direct aerosol effect for OsloAeroSec minus OsloAero_{def} (a) and OsloAeroSec minus OsloAero_{imp} (b). The direct radiative effect is calculated as recommended by Ghan (2013). Areas where the difference is significant (95 %) are marked with dots.

most likely explanation for the reduction in particles in the modal scheme with OsloAeroSec in our runs as well. In addition, we find that the reduction in number of particles in the modal scheme is largest where the concentration was largest initially and that in clean, remote regions, there is actually an increase in particle number.

In OsloAeroSec we let more organics (SOAG_{LV} and ELVOC) contribute to growth after 5 nm than is considered in OsloAero_{def} and OsloAero_{imp} (only ELVOC), which is likely why, in the higher atmosphere, OsloAeroSec often produces more particles than OsloAero_{imp}. However, this also illustrates the advantage of a sectional scheme, namely that it is possible to differentiate condensation by particle size.

Related to this, we show that the choice of nucleation parameterization, together with the representation of the chemical diurnal variation, has a large influence on the relative contribution of SOA and H_2SO_4 to the early growth of the NPF particles. This is especially true when the cut-off di-

ameter is high, as in OsloAero_{def} and OsloAero_{imp}. The reason is that the Riccobono et al. (2014) formulation is non-linear, as opposed to the Paasonen et al. (2010) parameterization, and thus forms proportionately more particles when H_2SO_4 concentrations are high. Including the sectional scheme (OsloAeroSec) counteracts this because particles grow for more than one time step and more SOAG_{LV} is allowed to contribute to growth.

In sum these effects illustrate that including NPF in global climate models, often with a very simplified chemistry, should be done with care. A parameterization may very well be physically sound, but might still give biased results if it is subjected to unrealistic (diurnal) variability in concentrations. If the cut-off diameter is high and the nucleation parameterization has a super-linear relationship with H_2SO_4 , the influence of organics on survival to larger sizes might be diminished, resulting in a weaker response to changes in BVOC emissions either in terms of climate feedbacks or

forcing for e.g. deforestation and afforestation (Sporre et al., 2019, 2020).

As mentioned, the changes introduced by inserting a sectional scheme are heterogeneous in space and time. The number concentration of particles in the modal scheme in general decreases where concentrations were initially high and increases where they were low. A topic for further research is therefore how this would influence the modelled effective radiative forcing from cloud–aerosol interaction (ERFaci). If the OsloAeroSec produces more particles in the cleaner pre-industrial atmosphere and fewer in the present-day atmosphere, it could reduce the ERFaci. Furthermore, the response to both historical and future changes in BVOC emissions may also be different (Sporre et al., 2020) due to a larger role in the early growth.

Furthermore, considering only the station observation comparison and the general decline in CCN-sized number concentration, one might be inclined to think that the same improvement could be achieved by simply reducing the nucleation rate or the survival rate from the Lehtinen et al. (2007) parameterization. However, the fact that the sectional scheme produces more particles in the remote atmosphere shows that such a quick fix would in fact not produce the same climatic effects and could quite possibly create other sensitivities to emission changes.

Interestingly, the cloud–aerosol effects show clear nonlinearities and contradict the simplest assumption that more NPF leads to more CCN, which lead to brighter clouds. The correlation between CDNC and NPF particles (N_{NPF} , Fig. 11) rather shows that in polluted regions more NPF results in less CDNC, and the reverse in remote regions. This is due to the fact that when NPF increases, the condensate is spread over more particles, reducing the individual particle size so that fewer are activated as CCN at a given supersaturation (an effect shown in e.g. Sullivan et al., 2018).

A weakness of the approach of merging a sectional scheme and a modal scheme is that the sectional scheme will grow the particles to the size of the volume median diameter of the particles, but when they are inserted into the modal scheme, these particles are represented with a mode distribution, meaning some of them will “shrink” again, i.e. be on the lower tail of the distribution. However, this is not uniquely a problem for the sectional scheme – any modal representation of aerosol particles includes this effect, and the original parameterization in CAM6-Nor makes the same “error”. However, improving the early growth parameterization shines a light on this inconsistency, especially because when we plot the size distribution, the number of small particles becomes the sum of the sectional scheme and the modal approximation.

Furthermore, we include a limited number of processes for the sectional scheme (nucleation, coagulation and condensation, while wet and dry deposition are assumed to be negligible). This is done for simplicity and is also consistent with the processes considered when using Lehtinen et al. (2007) to

parameterize the early growth. Including dry and wet deposition might decrease the number concentrations in the model.

The oxidant concentrations in these simulations are read from monthly mean files and used with a superimposed diurnal variation. Any factor that could impact the oxidant concentration – be it changes in chemical sinks or changes to radiation – will not be accounted for. Since new particle formation is very dependent on this chemistry (see e.g. Lee et al., 2019), this inhibits how close the model can come to reality.

In terms of computational cost, we tested running 1 month with standard output fields and the setup described in Sect. 3.1, i.e. active land model and atmosphere, and the computational cost is increased by $\sim 15\%$ with OsloAeroSec compared to OsloAero_{def}.

6 Conclusions

A sectional scheme has been included in the aerosol scheme in CAM6-Nor to explicitly treat the early growth of particles and subsequently feed particles into the pre-existing aerosol scheme. The scheme includes two condensing species, SOAG_{LV} and H₂SO₄, and five bins. In addition, the diurnal variation in the oxidant concentrations has been improved, and the nucleation parameterization has been updated.

We compare a simulation with the implemented sectional scheme, OsloAeroSec, to two simulations with different versions of the original scheme – one with the default nucleation scheme and oxidant concentrations, OsloAero_{def}, and one in which these are updated to match the sectional scheme, OsloAero_{imp}.

We compare the model output to observations of aerosol concentrations from 2008 and 2009 from 24 stations in Europe (EUSAAR; Asmi et al., 2011a). We find that all versions of the model overestimate the particles smaller than 100 nm, while the sectional scheme shows clear improvement compared to the other two. The largest improvements are in the N_{50-100} in the summer, while changes are insignificant over 100 nm in diameter.

In general, the sectional scheme reduces the number of particles in the modal scheme near the surface while increasing it further up in the atmosphere and in remote regions.

The decrease in polluted regions is likely due to overestimation in the original scheme due to the high cut-off diameter of the aerosol scheme (Olenius and Riipinen, 2017; Lee et al., 2013).

The relative contributions of H₂SO₄ and SOAG_{LV} to the early growth of the particles changes between all the model versions. This is due to the complex interplay between in the introduction of diurnal variation of the oxidants, changes to the nucleation equation and the introduction of a sectional scheme. This illustrates that care must be taken when implementing NPF in global models because a highly simplified chemistry may have unintended effects on the sensitivities of NPF to e.g. changing emissions.

We also analyse the cloud changes and show how the effect of the changes in NPF are heterogeneous in space. An assumption that more particles from NPF lead to more activated CCN and increased CDNC fails in most regions close to the surface, where the inverse is true. Higher up in the atmosphere and in remote regions, however, the relationship holds.

In general, this study shows that combining a sectional scheme for early growth with a modal scheme for the larger particles is possible and that this treatment of early growth improves the representation in the smaller CCN size range.

Code and data availability. The output data from the simulations used are available for download at <https://doi.org/10.11582/2020.00056> (Blichner, 2020a). The model code of NorESM2, release 2.0.1, is available at <https://doi.org/10.5281/zenodo.3760870> (Seland et al., 2020a). The code modifications in OsloAeroSec, simulation configurations and setup instructions are released at <https://doi.org/10.5281/zenodo.4265057> (Blichner, 2020b). The post-processing code used to produce the figures is available at <https://doi.org/10.5281/zenodo.4265033> (Blichner, 2020c). The observational data are available via Asmi et al. (2011a) at <https://doi.org/10.1594/PANGAEA.861856> (Asmi et al., 2011b).

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